

# A Hybrid Multivector Model Predictive Control for an Inner-Interleaved Hybrid Multilevel Converter

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**Abstract**—A hybrid multivector model predictive control strategy for an inner-interleaved hybrid multilevel converter is brought forward in this work, which can enable the separation of the low- and high-frequency stages. It initiates with the use of sign patterns of the reference vector in the stationary reference frame to determine switching states of the low-frequency stage. Then, the reference vector is converted to the inner virtual space vector diagram, which is further transformed into a 120° oblique coordinate system, where the adjacent vectors are selected. Further, the current tracking is realized through the duty cycle optimization of the chosen vectors. Finally, a symmetric switching sequence, which serves as the best one for dc capacitors voltages balancing and circulating current suppression, is selected among all the switching sequences that belong to the three chosen vectors with optimal duty cycles. The proposed method reduces both current ripples and computational burden while achieving a constant equivalent switching frequency. Comprehensive experimental results performed on an all silicon-carbide prototype verify the effectiveness of the proposed control.

**Index Terms**—Hybrid multilevel converter (HMC), model predictive control (MPC), optimal duty cycle.

## NOMENCLATURE

$j$	Three phases, $j \in \{a, b, c\}$ .
$x$	Power switch index, $x \in \{1, 2, \dots, 10\}$ .
$R, L$	Load resistance and inductance.
$U_{dc}$	External dc-source voltage.
$u_{dc\_1}, u_{dc\_2}$	DC-link capacitor voltages and deviation.
$\Delta u_{dc}$	Deviation of dc-link capacitor voltages.
$L_0, L_{eq}$	Interleaved and equivalent inductance.
$v, i$	Converter voltage and current vectors.
$C, C_1$	DC-link and flying capacitance.
$u_{dc\_j1}, i_{fj}$	Flying capacitors voltages and currents.
$i_{dc\_1}, i_{dc\_2}$	Currents of the dc-link capacitors.
$i_{oj}, i_o$	Three-phase and total neutral point currents.
$i_j, i_{cj}$	Converter phase and circulating currents.
$i_{j1}, i_{j2}$	Currents of the interleaved legs.
$u_{j01}, u_{j02}$	Interleaved legs voltages in each phase.
$v_j$	Equivalent three-phase output voltages.
$M_{jx}$	Power switches in each phase.
$S_j, S_{jx}$	Switching states of phase $j$ and power switches.
$d_x$	Duty cycles of the power switches.

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$y(k), y(k+1)$	Variable $y$ at $k, k+1$ time instant.
$v^*, v_{abc}^*$	Reference vectors in $\alpha\beta$ - and $abc$ -coordinate.
$v_v^*$	Reference in the virtual space vector diagram.
$V_n, S_n$	Shift vector and state, $n \in \{1, 2, \dots, 6\}$ .
$v_{v1}^*, \theta_{v1}$	Virtual reference vector and its angle in Sector 1 of the virtual space vector diagram.
$V_k, S_k$	Adjacent vectors and their slopes, $k \in \{1, 2, 3\}$ .
$t_k$	Dwell time of the three chosen vectors.
$d_k$	Optimal duty cycles of the three chose vectors.
$T_s$	Control or sampling period
$[V_{vg1} \ V_{vh1}]^T$	Virtual reference vector in the 120° $gh$ -frame.
$J_{dc}, J_{cir}$	DC voltages and circulating currents cost function.
$J, J_{min}$	Total cost function and minimum cost function.
$\lambda_1, \lambda_2$	Weighting factors.
$S_{jx\_i}$	The $i$ th switching state of $M_{jx}$ , $i \in \{1, 2, 3, 4\}$ .

## I. INTRODUCTION

HYBRID multilevel converters (HMCs) [1] have been ever-increasingly injecting vitality to the multilevel converter family [2] over the past few decades, which are adopted in a wide range of applications [3]-[5]. Compared with multilevel converters constructed with a single type of power electronic building block (PEBB) [6], the HMC has multiple advantages due to the integration of multiple PEBBs into the topology [7]. In particular, the inner-interleaved HMCs (IHMCs), which contains inner-interleaved structures, feature additional benefits such as increased output voltage levels, reduced device current stress, enhanced modularity [8], etc. In spite of inarguable advantages, the combination of various types of PEBBs complicates the control of HMCs, especially the IHMCs, which therefore, requires enhanced control strategies to deal with multiple control objectives, e.g., capacitor voltages balancing, current quality improvement, and circulating current mitigation, etc.

Heretofore, the vast majority of research effort on the control of the HMCs concentrates upon the phase-disposition (PD) pulse width modulation (PWM) [9], the phase-shifted (PS) PWM [2], [10], and the space vector modulation (SVM) [3], [11], which, although mature, suffer from inherent weaknesses, to name a few: the difficulty to balance dc capacitor voltages and to tune controller parameters, and the cross-coupling among co-existing multiple control loops [12]. In addition, due to the increased complexity of the IHMC in both circuit-level and control-level, achieving capacitor voltage balancing and other control objectives may become even harder. In particular, an SVM for a five-level diode-clamped-converter is proposed in [13], which innovatively

uses the minimum energy concept, searching for the lowest derivative of the energy coefficient, effectively achieves the current tracking and dc voltage balancing at the same time. However, this SVM method is specifically designed for this five-level diode-clamped-converter, where the minimization of the dc capacitor energy is very similar to the cost function minimization process of the model predictive control (MPC) [14], which on the other hand, is born for dealing with multi-objective controls [15], [16], and therefore, perfectly fits the needs of HMCs. Nevertheless, it faces two major challenges when applied to HMCs. On one hand, assessing the massive switching states brought by the multilevel topology significantly burdens the state-of-the-art digital processors [17]. On the other hand, applying only one switching state over each control period results in relatively large output current ripples and a variable equivalent switching frequency, which further complicates the filter design [18].

Meanwhile, a broad range of research has been conducted in an effort to cope with these issues. For instance, the dc capacitors voltages sorting method is adopted to mitigate the calculation burden in modular multilevel converters [19] and cascaded H-bridge converters [20]. In [21], the proposed indirect MPC for the MMC uses the field programmable gate array (FPGA) to conduct the sorting algorithm, while the switching control actions are further simplified through consideration of only neighboring index values with respect to their previously applied values, which significantly reduces the computational burden. In [18], a simplified MPC scheme is proposed to theoretically increase the sampling rate up to 60 kHz, which can fully exploit the benefits of the wide-bandgap (WBG) power devices. In addition, there are also extensive literatures focusing on the steady-state performance improvement for the MPC. A long-horizon MPC is introduced in [22], which however, faces tremendous calculation burden when increasing the prediction horizon. The authors hence bring forward a modified sphere decoding algorithm to dramatically reduce the calculation burden. Whereas, the long-horizon MPC still remains a mathematically complicated approach [15]. In [23], the sampling cycle is divided into  $N$  parts, enabling insertion of  $N$  voltage vectors within each control period, such that the current tracking can be improved. However, the performance of this method depends largely on the circuit parameters. A novel MPC method that combines the reference trajectory tracking and its derivative trajectory tracking together is presented in [24] to reduce the voltage total harmonic distortion (THD). In addition, the virtual vectors-based MPC method has also been widely studied to improve the steady-state performance [7], [25]-[27], but is associated with several drawbacks. First, when dividing the control cycle, the pulse pattern is presumably asymmetric [26], which results in unnecessary switching actions. Second, the design of the virtual vectors group seems to vary greatly on a case-by-case basis [27]. Third, synthesis of the virtual vectors can result in higher switching frequency, and thus, higher power losses, unless the WBG devices are used [7].

In addition, there is also research attempting to design MPC with a constant equivalent switching frequency. In [28], the harmonics of the output current are shaped into concentrated groups by a notch filter, and in [29], the harmonics are re-shaped by a period management method. Nonetheless, these re-shaped harmonics are limited to the frequency barrier set by the sampling frequency, that is, half of the sampling frequency. In other words, the modification of the harmonics can only be conducted with the half sampling frequency range. When it comes to HMCs, the sampling frequency is very hard to be too high to provide enough bandwidth for the regulations of current harmonics. Moreover, the output current may have obvious oscillations at the regulated frequency when applying these methods [28]. Besides, the concept of duty cycle optimization is proposed in [30], then the three-vector-based MPC [31] for motor drives is brought forward recently, which also works well in achieving both satisfactory current tracking and the constant switching frequency. However, the abovementioned approaches cannot be directly employed to HMCs because of the enormous number of voltage vectors to be evaluated and the difficulty in shaping symmetric switching patterns. As such, there is a research gap.

This article proposes a hybrid multivector MPC (HMV-MPC) for a nine-level IHMC, which overcomes inherent obstacles of the conventional MPC (C-MPC). The proposed method can enable the separation of the low-frequency stage (LFS) and high-frequency stage (HFS) in the IHMC and reduce both the output current THD and computational burden while achieving a constant equivalent switching frequency. The remainder of this article is organized as follows. Section II analyzes the IHMC from the topological point of view. Section III elaborates the proposed HMV-MPC from LFS to HFS control. Section IV validates the proposed method by experimental results on an all silicon-carbide (SiC) prototype. Finally, Section VI draws the conclusion of this article.

## II. CIRCUIT DESCRIPTION

Fig. 1 illustrates the configuration of the nine-level IHMC, where  $u_{dc\_1} = u_{dc\_2} = U_{dc}/2$  and  $u_{dc\_j1} = U_{dc}/4$ . Table I lists all the switching states, where it can be seen that  $M_{j1}-M_{j4}$  can work at fundamental switching frequency. The IHMC is thereby split into an LFS and HFS, respectively, as highlighted in Fig.1.

### A. Comparison and Discussion

To better understand the advantages of the nine-level IHMC, comparisons between other nine-level multilevel topologies and the nine-level IHMC are hereby conducted. Fig. 2 demonstrates a wide range of nine-level multilevel topologies, covering the flying capacitor converter (FCC) [32], the hybrid MMC (HMMC) [1], the nine-level ANPC (ANPC-9L) [33], the five-level ANPC cascaded with H-bridge (ANPC-5L-H) [34], the stacked T-type converter [35], the T-type ANPC converter (T-ANPC) [9], the flying capacitor (FC) internal parallel converter (IPC) (FC-IPC) [8], and the nine-level

IHMC in this work. Table II compares the above nine-level topologies in terms of LFS, HFS, and FCs count. As shown, the nine-level IHMC in this work has the lowest device count and lowest capacitor energy storage at the same time. Specifically, it is noteworthy that compared with the FC-IPC in [8], the nine-level IHMC in this work has two fewer power devices when generating a nine-level voltage. Therefore, voltage stresses across power devices of the HFS and the current stresses of  $M_{j7}$ - $M_{j9}$  are reduced, these facts can enable the choice of using lower-cost devices with lower-voltage or -current ratings.

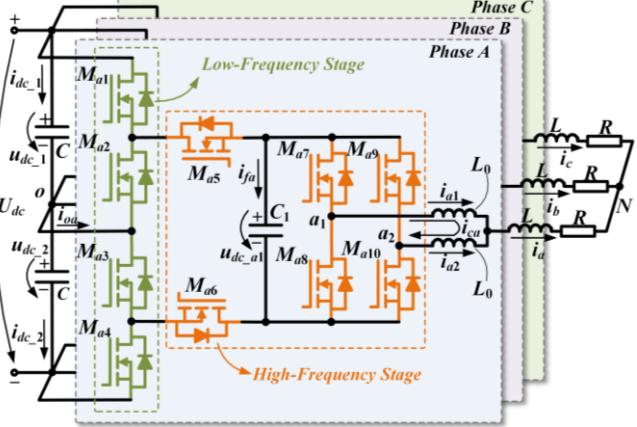


Fig. 1. The nine-level IHMC topology.

TABLE I

SWITCHING STATES OF THE NINE-LEVEL IHMC

Switching States $S_j$	LFS					HFS			
	$S_{j1}$ ( $S_{j2}$ )	$S_{j3}$ ( $S_{j4}$ )	$S_{j5}$ ( $S_{j6}$ )	$S_{j7}$ ( $S_{j8}$ )	$S_{j9}$ ( $S_{j10}$ )	$u_{j01}$	$u_{j02}$	$i_{oj}$	$i_{jf}$
8 ( $U_{dc}/2$ )	1	1	1	1	1	$U_{dc}/2$	$U_{dc}/2$	0	0
7 ( $3U_{dc}/8$ )	1	1	1	1	0	$U_{dc}/2$	$U_{dc}/4$	0	$i_{j2}$
	1	1	1	0	1	$U_{dc}/4$	$U_{dc}/2$	$i_{j1}$	
6 ( $U_{dc}/4$ )	1	1	1	0	0	$U_{dc}/4$	$U_{dc}/4$	0	$i_j$
	1	1	0	1	1	$U_{dc}/4$	$U_{dc}/4$	$i_j$	$-i_j$
5 ( $U_{dc}/8$ )	1	1	0	1	0	$U_{dc}/4$	0	$i_j$	$-i_{j1}$
	1	1	0	0	1	0	$U_{dc}/4$	$i_j$	$-i_{j2}$
4 (0)	1	1	0	0	0	0	0	$i_j$	0
	0	0	1	1	1	0	0	$i_j$	0
3 ( $-U_{dc}/8$ )	0	0	1	1	0	0	$-U_{dc}/4$	$i_j$	$i_{j2}$
	0	0	1	0	1	$-U_{dc}/4$	0	$i_j$	$i_{j1}$
2 ( $-U_{dc}/4$ )	0	0	1	0	0	$-U_{dc}/4$	$-U_{dc}/4$	$i_j$	$i_j$
	0	0	0	1	1	$-U_{dc}/4$	$-U_{dc}/4$	0	$-i_j$
1 ( $-3U_{dc}/8$ )	0	0	0	1	0	$-U_{dc}/4$	$-U_{dc}/2$	0	$-i_{j1}$
	0	0	0	0	1	$-U_{dc}/2$	$-U_{dc}/4$	0	$-i_{j2}$
0 ( $-U_{dc}/2$ )	0	0	0	0	0	$-U_{dc}/2$	$-U_{dc}/2$	0	0

## B. Modeling and Analysis

1) *System Model*: The current model can be given by

$$\mathbf{v} = L_{eq} \frac{d\mathbf{i}}{dt} + iR \quad (1)$$

where  $\mathbf{v} = [v_\alpha \ v_\beta]^T$ ,  $\mathbf{i} = [i_\alpha \ i_\beta]^T$ , and  $L_{eq} = L_0/2 + L$ . Also, the equivalent output voltage  $v_j = (u_{j01} + u_{j02})/2$  [36].

2) *Capacitor Model*: The models of the dc capacitors are

$$i_o = C \frac{d\Delta u_{dc}}{dt} \quad (2)$$

$$i_{jf} = C_1 \frac{du_{dc_{-j1}}}{dt} \quad (3)$$

where

$$i_o = \sum_{j=a,b,c} i_{oj} = \sum_{j=a,b,c} (S_{j1} + S_{j5} - 2S_{j1}S_{j5})i_j \quad (4)$$

$$i_{jf} = S_{j5}i_j - S_{j7}i_{j1} - S_{j9}i_{j2}. \quad (5)$$

3) *Inner Circulating Current Model*: The models of the inner circulating currents can be given by

$$u_{j01} - u_{j02} = 2L_0 \frac{di_{cj}}{dt} \quad (6)$$

where

$$\begin{cases} u_{j01} = U_{dc} (S_{j1}/2 + S_{j5}/4 + S_{j7}/4 - 1/2) \\ u_{j02} = U_{dc} (S_{j1}/2 + S_{j5}/4 + S_{j9}/4 - 1/2) \end{cases} \quad (7)$$

$$i_{cj} = (i_{j1} - i_{j2})/2. \quad (8)$$

TABLE II  
COMPARISON OF VARIOUS NINE-LEVEL MULTILEVEL CONVERTERS

Topology	Device Count			Energy Storage
	LFS Switch	HFS Switch	FC	
FCC	0	16	7	$\varepsilon = \frac{43}{32} CU_{dc}^2$
HMMC	4	8	4	$\varepsilon = \frac{3}{8} CU_{dc}^2$
ANPC-9L	4	8	3	$\varepsilon = \frac{23}{64} CU_{dc}^2$
ANPC-5L-H	4	8	2	$\varepsilon = \frac{37}{128} CU_{dc}^2$
S-T	0	16	6	$\varepsilon = \frac{15}{32} CU_{dc}^2$
T-ANPC	4	10	4	$\varepsilon = \frac{21}{64} CU_{dc}^2$
FC-IPC	4	8	2	$\varepsilon = \frac{5}{16} CU_{dc}^2$
Nine-Level IHMC	4	6	1	$\varepsilon = \frac{9}{32} CU_{dc}^2$

4) *Discrete-Time Model*: The discrete-time models can be obtained by applying the Euler Forward Approximation as

$$\mathbf{i}(k+1) = T_s \mathbf{v}(k) / L_{eq} + (1 - RT_s / L_{eq}) \mathbf{i}(k) \quad (9)$$

$$\Delta u_{dc}(k+1) = T_s i_o(k) / C + \Delta u_{dc}(k) \quad (10)$$

$$u_{dc_{-j1}}(k+1) = T_s i_{jf}(k) / C_1 + u_{dc_{-j1}}(k) \quad (11)$$

$$i_{cj}(k+1) = T_s [u_{j01}(k) - u_{j02}(k)] / (2L_0) + i_{cj}(k). \quad (12)$$

When applying multiple vectors, the current variables at time instant  $k$  can be given by

$$\begin{cases} i_{cj}(k) = [i_{j1}(k) - i_{j2}(k)]/2 \\ i_{jf}(k) = d_{j5}i_j(k) - d_{j7}i_{j1}(k) - d_{j9}i_{j2}(k) \\ i_o(k) = \sum_{j=a,b,c} (d_{j1} + d_{j5} - 2d_{j1}d_{j5})i_j(k) \end{cases} \quad (13)$$

The voltage variables at time instant  $k$  can be given in the duty cycle manner by:

$$\begin{cases} u_{j01}(k) = U_{dc} (d_{j1}/2 + d_{j5}/4 + d_{j7}/4 - 1/2) \\ u_{j02}(k) = U_{dc} (d_{j1}/2 + d_{j5}/4 + d_{j9}/4 - 1/2) \end{cases} \quad (14)$$

where  $d_{jx}$  can be simply derived through switching states of the employed vectors and their corresponding dwell time.

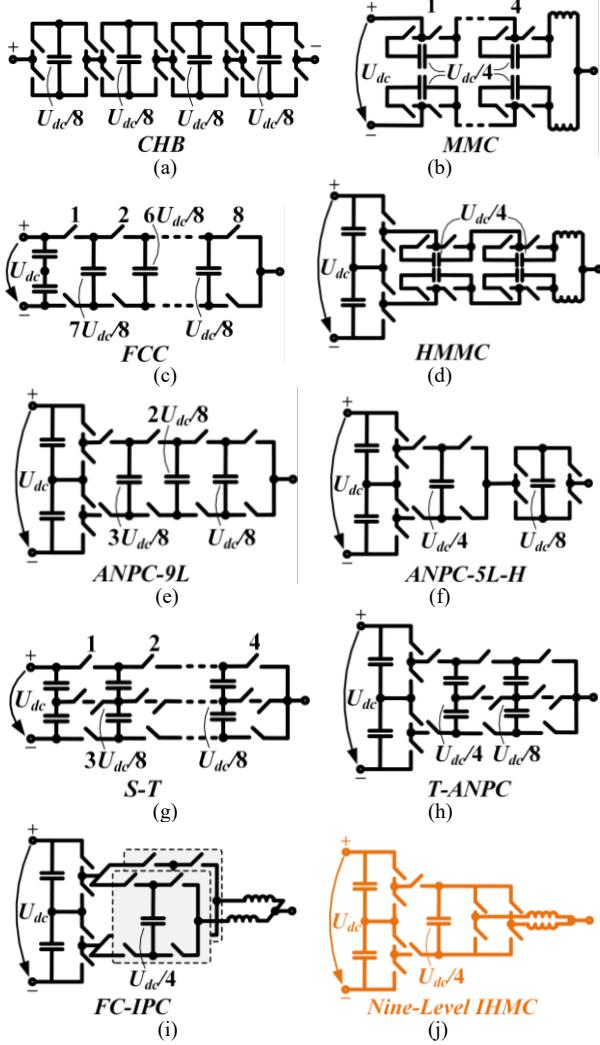


Fig. 2. Various nine-level multilevel topologies. (a) CHB, (b) MMC, (c) FCC, (d) HMMC, (e) ANPC-9L, (f) ANPC-5L-H, (g) S-T, (h) T-ANPC, (i) FC-IPC, and (j) Nine-level IHMC.

### III. HYBRID MULTIVECTOR MODEL PREDICTIVE CONTROL

#### A. LFS Control

The control framework of the proposed HMV-MPC is given in Fig. 3. Since  $S_{j1}/S_{j3}$  works at fundamental switching frequency, it can be directly determined by the sign pattern of the references. The reference vector, through the use of the system model (1), can be given by:

$$\mathbf{v}^*(k) = \frac{L_{eq}}{T_s} \mathbf{i}^*(k+1) + \left( R - \frac{L_{eq}}{T_s} \right) \mathbf{i}(k). \quad (15)$$

Then the reference vector in the  $abc$ -frame can be derived by the inverse Clarke Transformation [37] as  $\mathbf{v}_{abc}^* = [v_a^* \ v_b^* \ v_c^*]^T$ .

As such, the original space vector diagram (SVD) of the IHMC can be categorized into six types of internal hexagons (Fig. 4), i.e., the virtual SVDs, which respectively refer to the six sign patterns described in Table III. It is noteworthy that

although the reference vector may lie in the overlapped area of two adjacent internal hexagons, there are redundant switching states for each voltage vector in the space vector diagram, which are affiliated to adjacent hexagons separately. In other words, the voltage vectors in the overlapped areas have redundant switching states that can be subject to two different adjacent hexagons, which can be used individually to obtain optimal control performance.

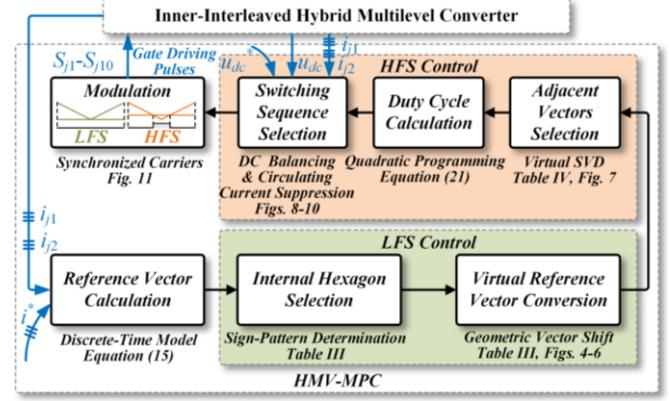


Fig. 3. The control framework of the proposed HMV-MPC.

As depicted in Fig. 5, the reference vector can be converted from the original SVD to the virtual SVD as

$$\mathbf{v}_v^* = \mathbf{v}^* - \mathbf{V}_n. \quad (16)$$

Proceeding to Fig. 6, the switching states of the original SVD and the virtual switching states of the virtual SVD are highlighted with yellow and grey background, respectively. Through adding the “Shift State” in Table III to the virtual switching states, the original switching states can be obtained.

TABLE III  
SWITCHING STATES OF THE INTERNAL HEXAGON

Sign Pattern	$S_{j1}S_{j2}S_{j3}$	Internal Hexagon ( $H_n$ )	Shift Vector ( $\mathbf{V}_n$ )	Shift State ( $\mathbf{S}_n$ )
$\geq 0$	$\leq 0 \leq 0$	100	$\mathbf{V}_1 = [4 \ 0]$	$\mathbf{S}_1 = [4 \ 0 \ 0]$
$\geq 0$	$\geq 0 \leq 0$	110	$\mathbf{V}_2 = [2 \ 2\sqrt{3}]$	$\mathbf{S}_2 = [4 \ 4 \ 0]$
$\leq 0$	$\geq 0 \leq 0$	010	$\mathbf{V}_3 = [-2 \ 2\sqrt{3}]$	$\mathbf{S}_3 = [0 \ 4 \ 0]$
$\leq 0$	$\geq 0 \geq 0$	011	$\mathbf{V}_4 = [-4 \ 0]$	$\mathbf{S}_4 = [0 \ 4 \ 4]$
$\leq 0$	$\leq 0 \geq 0$	001	$\mathbf{V}_5 = [-2 \ -2\sqrt{3}]$	$\mathbf{S}_5 = [0 \ 0 \ 4]$
$\geq 0$	$\leq 0 \geq 0$	101	$\mathbf{V}_6 = [2 \ -2\sqrt{3}]$	$\mathbf{S}_6 = [4 \ 0 \ 4]$

#### B. HFS Control

##### 1) Multivector Selection:

There are two effective ways to facilitate the selection process: 1) through leveraging the symmetry of the virtual SVD [18], the selection process can be performed in Sector 1 of the virtual SVD, and 2) via converting the  $\alpha\beta$ -frame to the  $120^\circ$   $gh$ -frame [18], a complete integer coordinate system is established, which leads to the integer arithmetic when seeking multiple vectors, which further, translates into a much simpler calculation process than the trigonometric calculation or the lookup-table approach [31].

Fig. 7 depicts the virtual reference vector and its adjacent vectors in Sector 1 of the virtual SVD, where the minimum-value switching states are defined as the fundamental switching states (FSSs). The conversion table of the FSSs is

exhibited in Table IV, where  $[S_{va1} \ S_{vb1} \ S_{vc1}]$  is the FSS in Sector 1. The vector  $V_1$  in the  $120^\circ$   $gh$ -frame can be given by

$$[g_{v0} \ h_{v0}]^T = \begin{bmatrix} V_{vg1} \\ V_{vh1} \end{bmatrix}^T. \quad (17)$$

The following criterion can be applied to further define the switching triangle type where the reference vector locates in:

$$v_{v1}^* \in \begin{cases} \text{I, } V_{vg1} - V_{vh1} \leq g_{v0} - h_{v0} \\ \text{II, } V_{vg1} - V_{vh1} > g_{v0} - h_{v0} \end{cases}. \quad (18)$$

Recapping Fig. 7, the vectors  $V_k$  are the chosen adjacent vectors, the FSSs of which can be deduced from the vector coordinates, as per the characteristic of the  $120^\circ$  coordinate system [18].

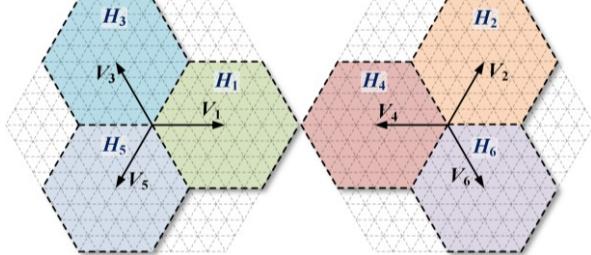


Fig. 4. Six virtual SVDs in the original SVD.

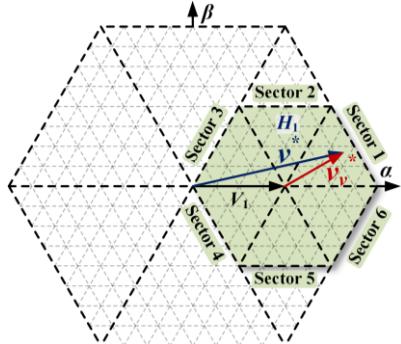


Fig. 5. Vector shifting process (to Hexagon H1).

## 2) Duty Cycle Optimization:

TABLE IV  
FSS CONVERSION TABLE

Sector	Phase A	Phase B	Phase C
1	$S_{va1}$	$S_{vb1}$	$S_{vc1}$
2	$S_{va1} - S_{vb1}$	$S_{va1}$	0
3	0	$S_{va1}$	$S_{vb1}$
4	0	$S_{va1} - S_{vb1}$	$S_{va1}$
5	$S_{vb1}$	0	$S_{va1}$
6	$S_{va1}$	0	$S_{va1} - S_{vb1}$

The duty cycle optimization is enabled by the current tracking error minimization. The current slopes are given by

$$s_k = (V_k - iR)/L \quad (19)$$

where  $s_k = [s_{ak} \ s_{bk}]^T$ . Then, the current error can be given by

$$\begin{cases} \Delta I_\alpha = I_\alpha - s_{\alpha 1}t_1 - s_{\alpha 2}t_2 - s_{\alpha 3}(T_s - t_1 - t_2) \\ \Delta I_\beta = I_\beta - s_{\beta 1}t_1 - s_{\beta 2}t_2 - s_{\beta 3}(T_s - t_1 - t_2) \end{cases} \quad (20)$$

where  $I_\alpha = i_\alpha^*(k+1) - i_\alpha(k)$ ,  $I_\beta = i_\beta^*(k+1) - i_\beta(k)$ . Subsequently, the cost function is given by  $J = \Delta I_\alpha^2 + \Delta I_\beta^2$ . To solve the quadratic programming problem, the optimal condition can be obtained through the gradient method [38]:

$$\partial J / \partial t_1 = 0; \partial J / \partial t_2 = 0. \quad (21)$$

Solving (21) yields the optimal duty cycles:

$$\begin{cases} d_1 = \frac{I_\alpha(s_{\beta 3} - s_{\beta 2}) + I_\beta(s_{\alpha 2} - s_{\alpha 3}) + T_s(s_{\alpha 3}s_{\beta 2} - s_{\alpha 2}s_{\beta 3})}{T_s s_{\beta 1}(s_{\alpha 2} - s_{\alpha 3}) + T_s s_{\beta 2}(s_{\alpha 3} - s_{\alpha 1}) + T_s s_{\beta 3}(s_{\alpha 1} - s_{\alpha 2})} \\ d_2 = \frac{I_\alpha(s_{\beta 1} - s_{\beta 3}) + I_\beta(s_{\alpha 3} - s_{\alpha 1}) + T_s(s_{\alpha 1}s_{\beta 3} - s_{\alpha 3}s_{\beta 1})}{T_s s_{\beta 1}(s_{\alpha 2} - s_{\alpha 3}) + T_s s_{\beta 2}(s_{\alpha 3} - s_{\alpha 1}) + T_s s_{\beta 3}(s_{\alpha 1} - s_{\alpha 2})} \\ d_3 = 1 - d_1 - d_2 \end{cases} \quad (22)$$

where  $d_k = t_k/T_s$ .

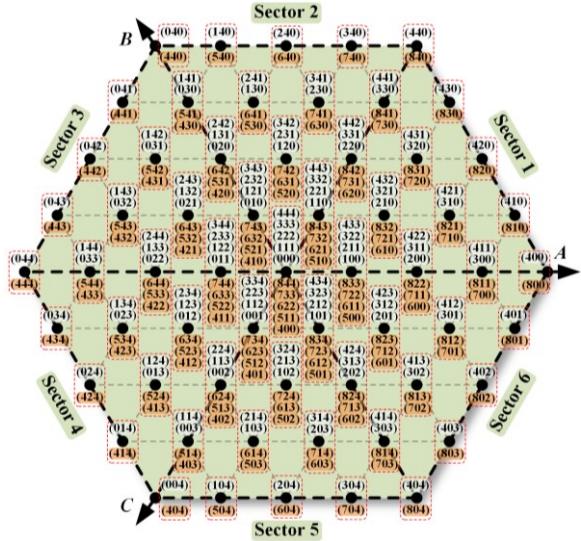


Fig. 6. Original and virtual SSs in the virtual SVD (Hexagon H1).

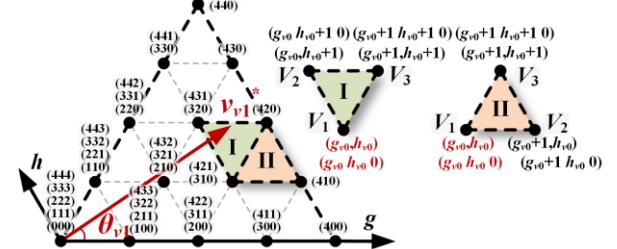


Fig. 7. The multiple adjacent vectors in Sector 1 of the virtual SVD.

## 3) Switching Sequence Selection and Modulation:

The symmetric switching sequences (SSs), the ones have fixed equivalent switching frequency, can be achieved through: 1) shifting only one voltage level over each switching cycle and 2) resuming the voltage level when each switching cycle ends to lower switching actions. Fig. 8 shows the switching states of the chosen vectors distributed to six sectors, and Fig. 9 enumerates all the symmetric SSs that are subject to the chosen vectors, where the vectors of each sector are marked with various background color. Notably, four switching states are employed in total over each control cycle. As it can be seen, the initial direction of the vector rotation in Sectors 1, 3, and 5 is inverse to that in Sectors 2, 4, and 6, i.e., in a clockwise and counter-clockwise manner, respectively. As such, all the symmetric SSs can be found in an effort to leverage the symmetry of the virtual SVD, which further leads to the abandonment of the inefficient lookup-table [31].

Further, selecting the symmetric SS can be transformed into an optimization problem whose constraint conditions are the regulation of dc capacitor voltages and suppression of inner circulating currents. Thus, the cost functions can be given by

$$\begin{cases} J_{dc} = \sum_{j=a,b,c} \|u_{dc\_j1}(k+1) - U_{dc}/4\|_2^2 + \|\Delta u_{dc}(k+1)\|_2^2 \\ J_{cir} = \sum_{j=a,b,c} \|i_{cj}(k+1)\|_2^2 \\ J = \lambda_1 J_{dc} + \lambda_2 J_{cir} \end{cases} \quad . \quad (23)$$

In addition, the duty cycles of each switch can be derived by

$$d_{jx} = D_1 (S_{jx\_1} + S_{jx\_4})/2 + D_2 S_{jx\_2} + D_3 S_{jx\_3} \quad (24)$$

where  $D_k \in \{d_1, d_2, d_3\}$ , which is defined as the duty cycles of the vectors in the candidate SS, with the initial vector being either  $V_1$ ,  $V_2$ , or  $V_3$ , and  $S_{jx\_i}$  can be inferred from the  $i$ th switching state in the SS to be evaluated. Subsequently, the variables at time instant  $k+1$  can be attained by substituting (24) into (10)-(14). As a result, the description of the constrained optimization problem for seeking the optimal symmetric SS can be given by

$$\begin{cases} \min_{S_{jx\_i}} J \\ \text{s.t. equations (10)-(14), (22), and (24)} \\ S_{jx\_i} \in \{0, 1\} \\ \sum_{i=1}^3 D_i = 1 \end{cases} \quad . \quad (25)$$

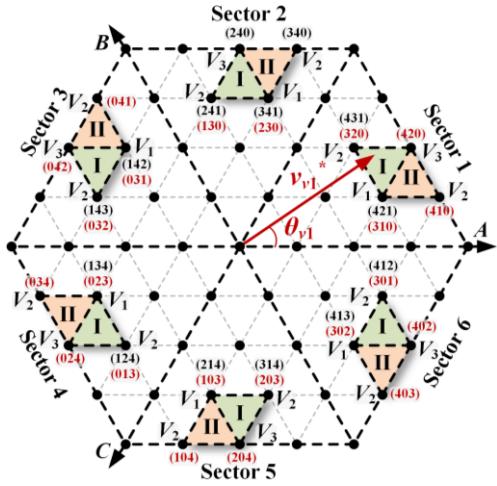


Fig. 8. The virtual SVD and switching states distributed to its six sectors.

Fig. 10 illustrates a flowchart, which, together with the control diagram in Fig. 3, gives an overview of the proposed HMV-MPC strategy. On top of that, the modulation for each switch can be conducted individually [7] through comparing the duty cycles derived from (24) with a group of synchronized triangle carriers. Fig. 11 exemplifies the modulation of one particular case in Figs. 8 and 9, where the selected SS in the virtual SVD is: (310), (320), (420), (421), (420), (320), and (310), which is equivalent to the SS in the original SVD: (531), (541), (641), (642), (641), (541), and (531), is selected ( $D_1 = 1/2$ ,  $D_2 = 1/4$ ,  $D_3 = 1/4$ ). As it can be seen, whenever the switching states unfolds the state shift of

1-to-0, it needs to adjust its derived duty cycle from (24), e.g., the  $S_{b9}$  is modulated by an inverse triangle carrier in Fig. 11.

In addition, due to the adoption of multiple vectors over each switching period, the delay effect caused by digital implementation is even severer [14], which significantly exacerbates the dc capacitor voltage balancing in particular. It is therefore of great significance to eradicate the adverse effect of the delay through two-step prediction of not only the current but also the dc voltages and circulating currents [7].

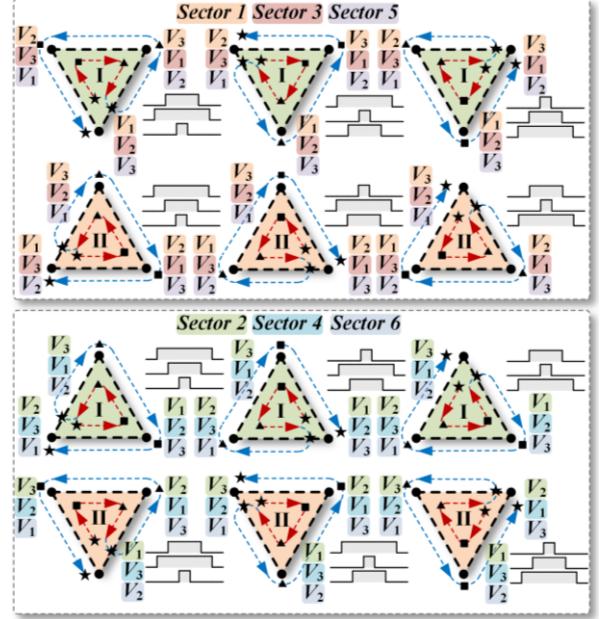


Fig. 9. Symmetric SSs subject to the chosen vectors.

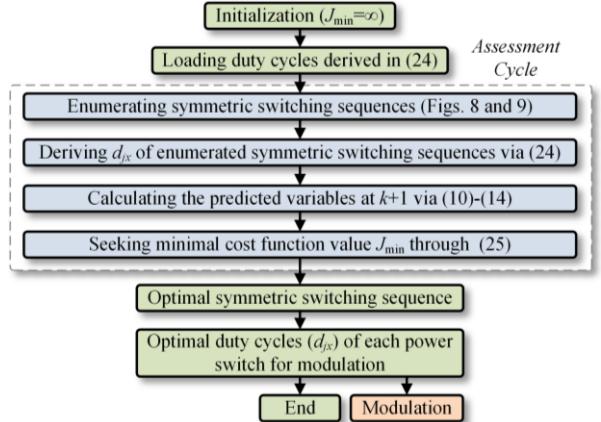


Fig. 10. Flowchart of the optimal SS selection.

#### IV. EXPERIMENTAL RESULTS

To evaluate the proposed HMV-MPC in a real-world scenario, an all-SiC scaled-down prototype is developed using the discrete SiC MOSFETs (Wolfspeed: C2M0160120D, 1.2 kV, 18 A, 160 mΩ) [39]. The system parameters are listed in Table IV. Fig. 12 shows the experimental rig. The control algorithm is conducted in the dSPACE MicroLabBox, while the gate pulses are generated by an Intel Max-10 FPGA. The optic fibers are used to enhance the noise immunity. To avoid

the infeasibility caused by tremendous computational burden, a modified C-MPC, which only assesses three vectors that encompass the reference vector [18], is used for comparison. Table V summarizes the average switching frequency and current THD comparison. As shown, the HMV-MPC at 8 kHz sampling rate even has lower average switching frequency than the C-MPC at 15 kHz sampling rate does, which hence, can be used as a benchmark for fair comparison. In addition, the operation limitation analysis of the nine-level IHMC with both the C-MPC and the proposed HMV-MPC is conducted through simulation study (since the resistive-inductive load is the only load we have) [13], [18]. All other parameters are the same as Table IV. The power factor is regulated through changing the load resistance, while the reference current is adjusted correspondingly based on the load impedance calculation at the same time. Whenever the inner circulating currents or floating capacitor voltages cannot be mitigated or balanced, the system is considered unstable. In this regard, the operation limitations are demonstrated in Fig. 13. As shown, for the vast majority of the operating points, the system is stable. Specifically, for all the circumstances enclosed by the solid line, the inner circulating currents or floating capacitor voltages can be mitigated or balanced, while for the conditions beyond the solid line, these control objectives cannot be guaranteed, thus, the converter system is unstable.

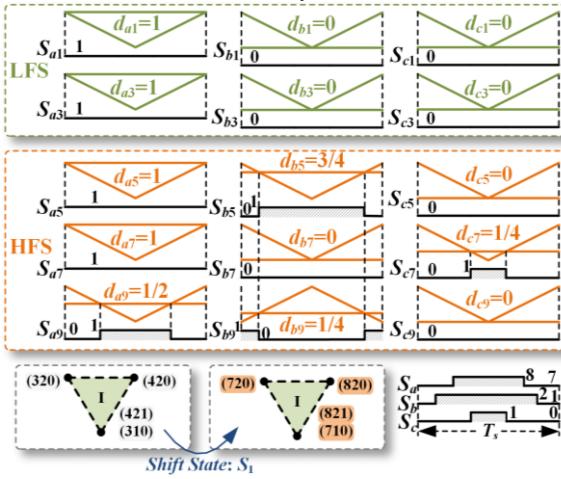


Fig. 11. Modulation of one specific symmetric SS.

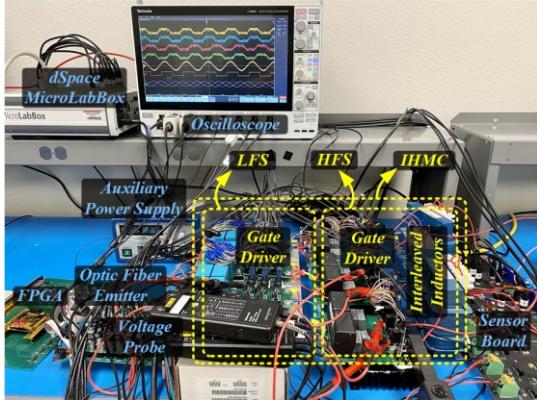


Fig. 12. Experimental rig.

Fig. 14 shows the steady-state waveforms, where the pulse trains of  $S_{a1}$  of the proposed HMV-MPC unfold fundamental-frequency patterns, which are in line with the control objective. On the contrary, the C-MPC reveals a relatively high-frequency patterns for pulse trains of  $S_{a1}$ . As set forth in Section III, the low-frequency pulse trains can enable fewer switching actions than the high-frequency ones and thus, results in lower switching losses. In addition, since the proposed HMV-MPC is actually based on the line-to-line voltage control from the SVD point of view, the equivalent line-to-line voltage  $v_{ab}$  shows a clear sinusoidal shape, which also possesses more voltage levels than the phase voltages do.

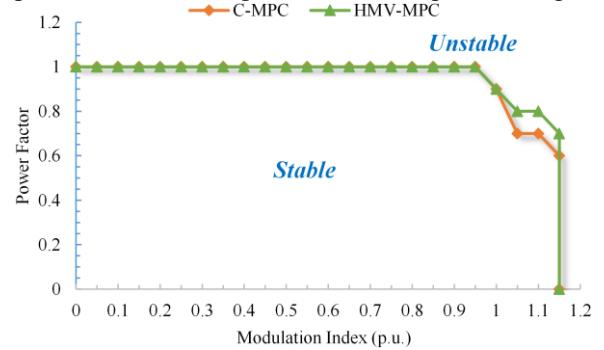


Fig. 13. Experimental rig.

Fig. 15 exemplifies Phase A to exhibit the steady-state performances of both control strategies. As it can be seen, even though the circulating current under the proposed HMV-MPC appears to have slightly larger ripples than the C-MPC does, the output current waveform of the proposed HMV-MPC at 8 kHz sampling rate is smoother than those of the C-MPC at both 8 kHz and 15 kHz sampling rate. Therefore, the main control objective, the current tracking, is better safeguarded by the proposed HMV-MPC. The dc voltages are all well-regulated under both control strategies. Fig. 16 demonstrates the waveforms at transient-state. As shown, all the dc voltages are well-regulated to their reference despite some trivial surges, which are caused by the inner-regulation of the dc power source. It also noteworthy that proposed HMV-MPC and the C-MPC at 8 kHz sampling rate have approximately the same responding time, while the C-MPC at 15 kHz has shorter responding time due to a higher sampling rate. In a nutshell, the responding time at all scenarios is relatively fast and the proposed HMV-MPC retains the fast dynamics nature of the MPC, while improves the current tracking performance at the same time. Furthermore, as it can be observed from the phase voltages, the C-MPC has a relatively higher  $dv/dt$  especially at the lower modulation range, where the phase voltage may shift more than one unit voltage step ( $U_{dc}/4$ ), which is caused by the concurrent switching action among power devices and may exacerbate the noise immunity of gate drivers. On the contrary, the HMV-MPC unfolds lower  $dv/dt$  due to the decoupling of the LFS and HFS, which shows another superior aspect over the C-MPC.

To further showcase the current THD improvement of HMV-MPC, the current spectra comparison based on the

collected oscilloscope data are depicted in Fig. 16. It can be observed in Fig. 16 that the proposed HMV-MPC at 8 kHz

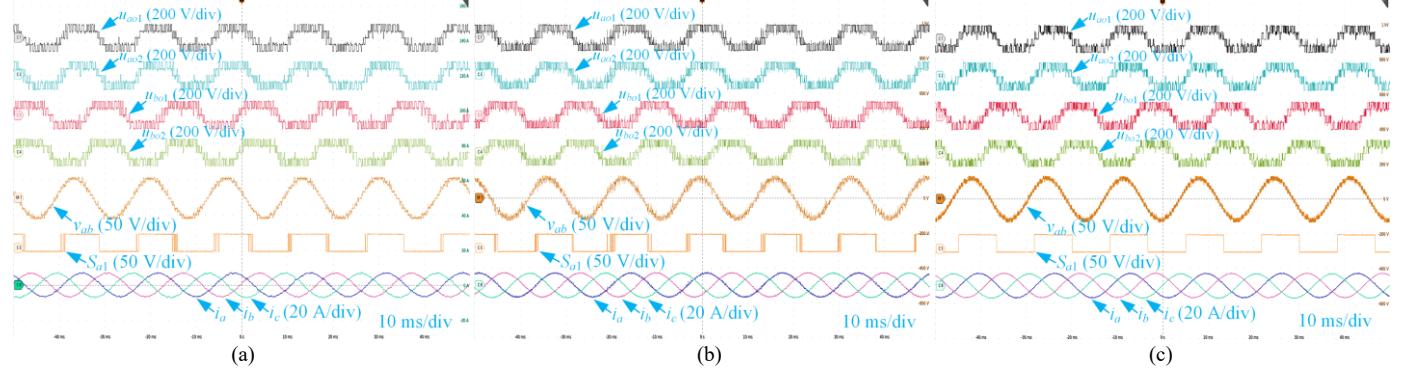


Fig. 13. Waveforms of steady-state. (a) C-MPC at 8 kHz sampling rate. (b) C-MPC at 15 kHz sampling rate. (c) HMV-MPC at 8 kHz sampling rate.

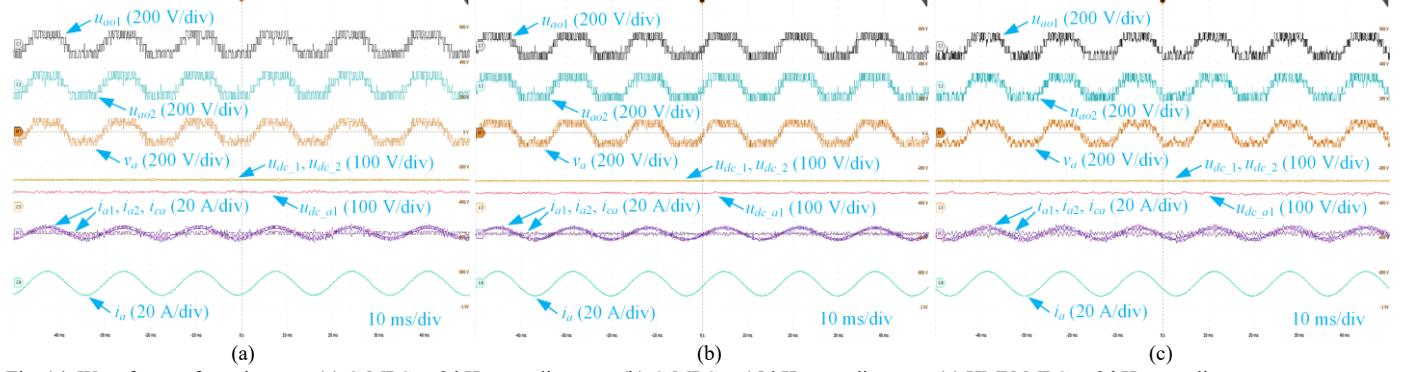


Fig. 14. Waveforms of steady-state. (a) C-MPC at 8 kHz sampling rate. (b) C-MPC at 15 kHz sampling rate. (c) HMV-MPC at 8 kHz sampling rate.

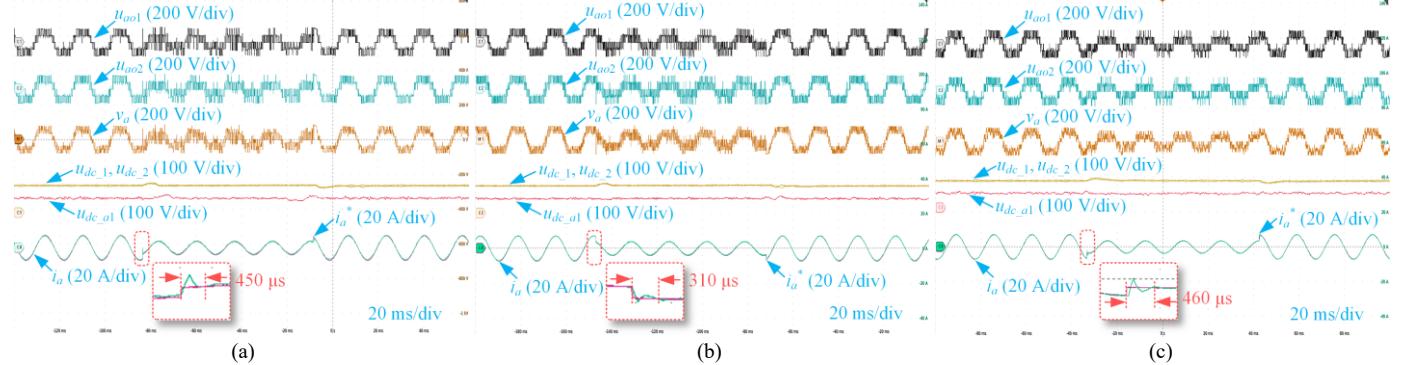


Fig. 15. Waveforms of transient-state. (a) C-MPC at 8 kHz sampling rate. (b) C-MPC at 15 kHz sampling rate. (c) HMV-MPC at 8 kHz sampling rate.

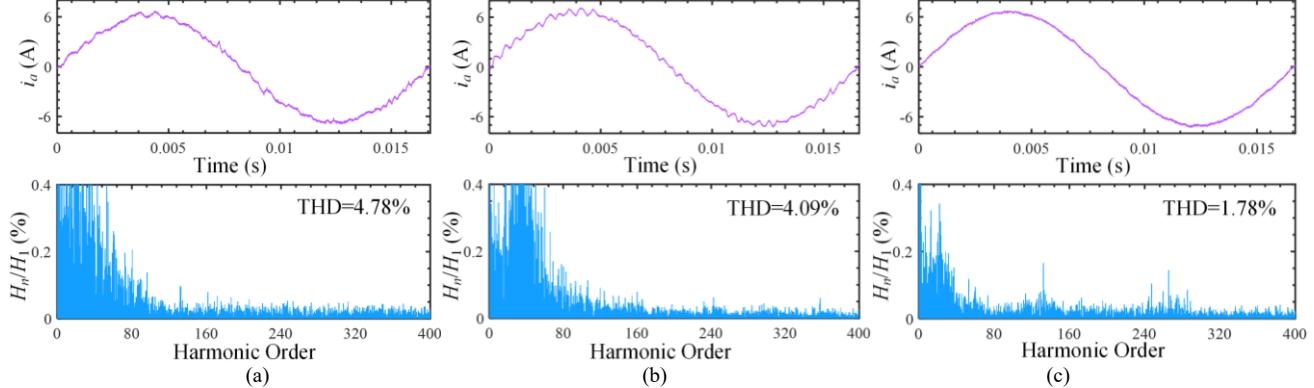


Fig. 16. Current spectra comparison. (a) C-MPC at 8 kHz sampling rate. (b) C-MPC at 15 kHz sampling rate. (c) HMV-MPC at 8 kHz sampling rate.

sampling rate has much lower current THD than the C-MPC does at both 8 kHz and 15 kHz sampling rate. In addition,

there are concentrated harmonic groups around 8 kHz, 16 kHz, and so on, in the output current spectra under the proposed

HMV-MPC, while the current spectra of C-MPC at both 8 kHz and 15 kHz exhibit more widespread fashions.

Fig. 17 depicts the comparison of the current THD versus amplitude by using the data in Table V. As shown, the current THD of the proposed HMV-MPC at 8 kHz sampling rate is lower than those of the C-MPC at both 8 kHz and 15 kHz sampling rate. Thus, it can be interpreted that the proposed HMV-MPC has better current tracking performance than the C-MPC does with even lower average switching frequency. Further, Fig. 18 shows the turnaround time comparison between the two algorithms, where the turnaround time is calculated in dSPACE using the real-time mode. Apparently, the proposed HMV-MPC enables approximately 34% turnaround time reduction, which indicates another advantage of the proposed HMV-MPC in addition to the current THD reduction.

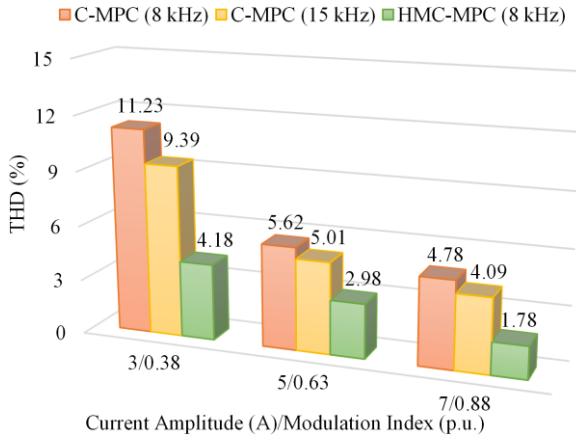


Fig. 17. Current THD comparison.

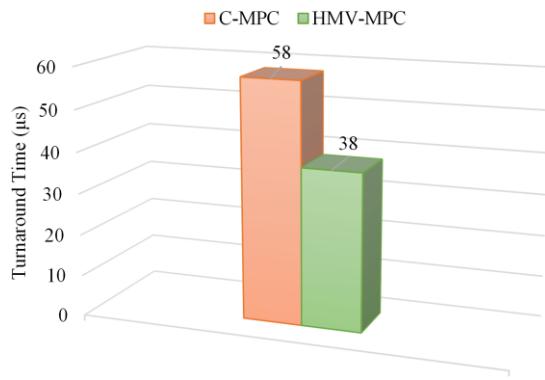


Fig. 18. Turnaround time comparison.

TABLE IV  
SYSTEM PARAMETERS

Variable Description	Symbol	Value
Interleaved inductance	$L_0$	2.5 mH
Load inductance	$L$	1.5 mH
Load resistance	$R$	10 $\Omega$
DC-link capacitance	$C$	240 $\mu\text{F}$
Floating capacitance	$C_1$	200 $\mu\text{F}$
Floating capacitor voltage	$U_{dc}$	160 V
H-bridge dc voltage	$u_{dc,1}$	40 V
Dead time	$T_d$	1 $\mu\text{s}$
Fundamental frequency	$f$	60 Hz

TABLE V  
THD AND SWITCHING FREQUENCY VERSUS CURRENT AMPLITUDE

Current Amplitude (A)	Control Method/ Sampling Rate	Average Switching Frequency (kHz)	THD ( $i_a$ , %)
3/0.38	C-MPC/8 kHz	2.552	11.23
	C-MPC/15 kHz	4.141	9.39
	<b>HMV-MPC/8 kHz</b>	<b>3.344</b>	<b>4.18</b>
5/0.63	C-MPC/8 kHz	2.254	5.62
	C-MPC/15 kHz	3.727	5.01
	<b>HMV-MPC/8 kHz</b>	<b>3.147</b>	<b>2.98</b>
7/0.88	C-MPC/8 kHz	1.708	4.78
	C-MPC/15 kHz	3.238	4.09
	<b>HMV-MPC/8 kHz</b>	<b>3.017</b>	<b>1.78</b>

## V. CONCLUSION

This article brings forward an HMV-MPC for a nine-level IHMC. The performance of the HMV-MPC is studied through comprehensive experiments, where the results substantiate the following aspects:

- 1) The proposed method enables the independent operation of the LFS and HFS, which leads to the reduction of the average switching frequency and may further pave the way for the hybrid use of SiC metal-oxide semiconductor field-effect transistors (MOSFETs) to the HFS and silicon (Si) insulated-gate bipolar transistors (IGBTs) to the LFS, to significantly enhance the cost-effectiveness and efficiency of the system.
- 2) The proposed method cuts down both the calculation burden and output current THD while retaining the fast dynamics nature of the MPC simultaneously.
- 3) The proposed method achieves a constant equivalent switching frequency and overcomes the variable switching frequency associated with the C-MPC, which further facilitates the filter design.
- 4) The dc capacitor voltage balancing and circulating current suppression are independent from the current tracking and therefore, has no impact on it.

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